# On the use of Simulated Photon Paths to Co-register TOA Radiances in EarthCARE Radiative Closure Experiments

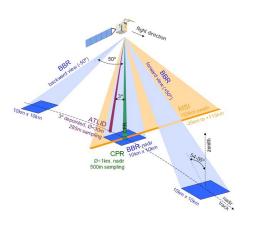
Florian Tornow, Carlos Domenech, Howard Barker

Institute for Space Sciences, FU Berlin

10.10.2014

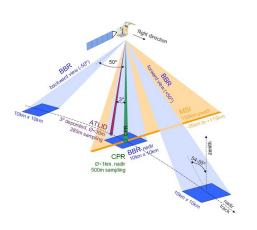






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  - aerosol
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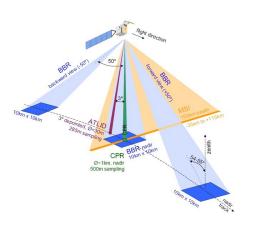
parameters with CPR, ATLID and MSI



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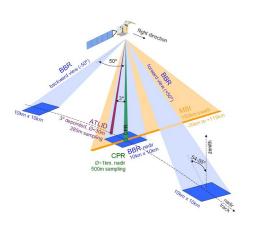
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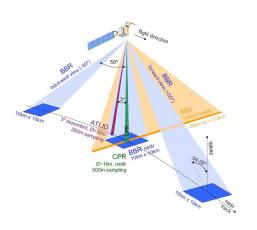
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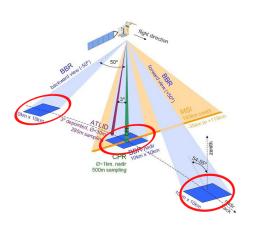


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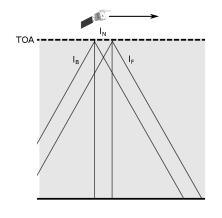
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3 along-track measurements of BBR <u>versus</u> simulations of 1D RTM or 3D Monte Carlo RTM



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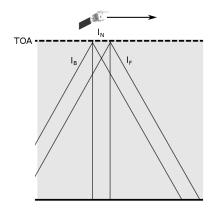
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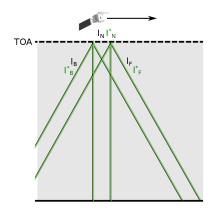
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this study: concerning a radiative closure with SW



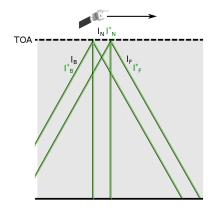
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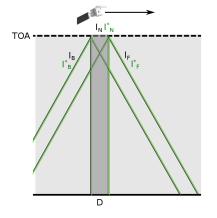
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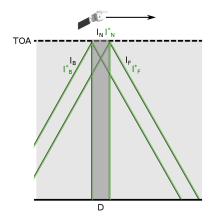
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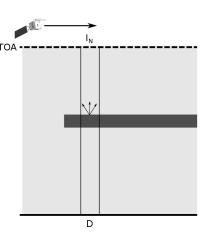
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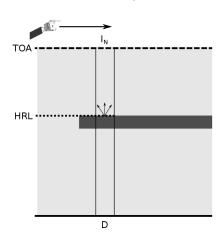
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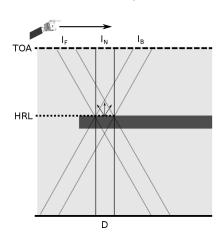
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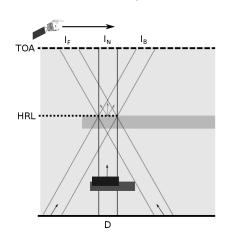
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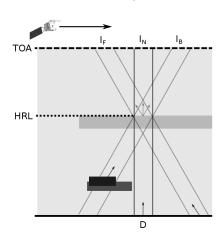
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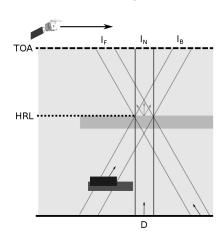
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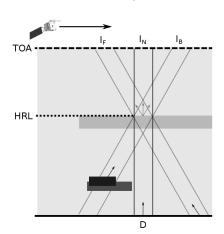
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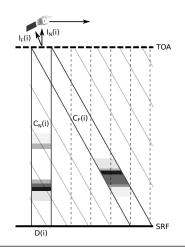
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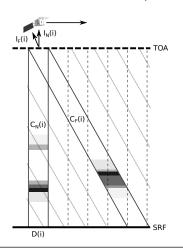
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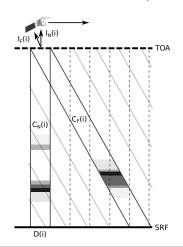
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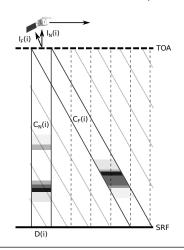
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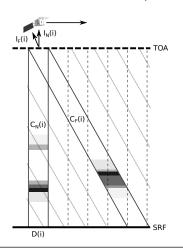
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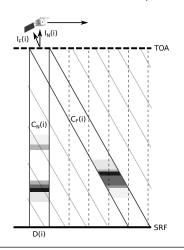
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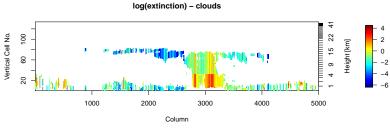


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based on CCCM data (A-Train) with vertical profiles of aerosol and cloud properties (similar to MSI, ATLID and CPR), but lacks BBR's oblique radiance measurements



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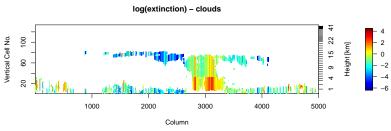
- using original CCCM data
- apply 3D MC RTS
- obtain BBR-like radiances

#### > perturbed run

- adding noise to cloud parameters (i.e. liquid, ice water contents, droplet effective radius and crystal effective diameter)
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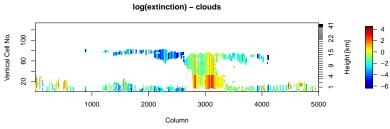
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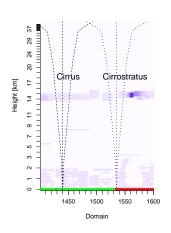


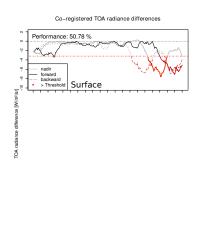
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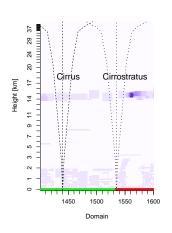
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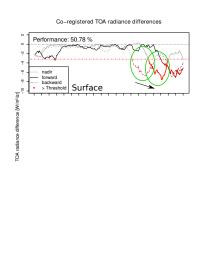
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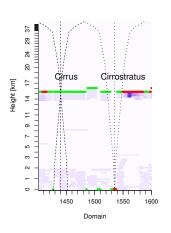


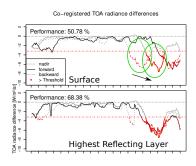
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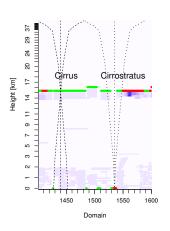


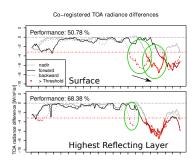
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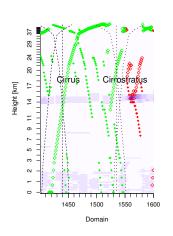


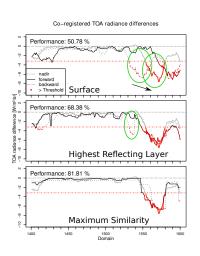


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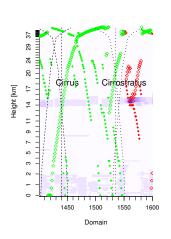


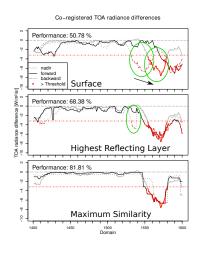




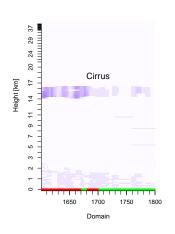


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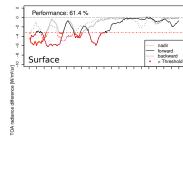




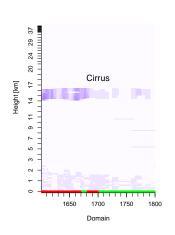
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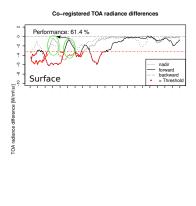




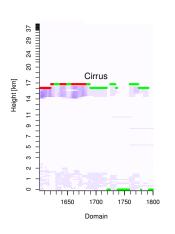


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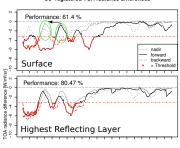


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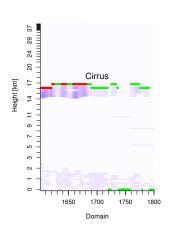


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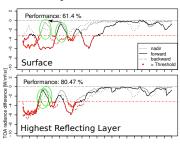
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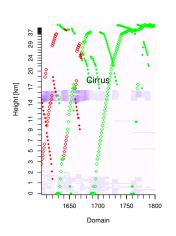
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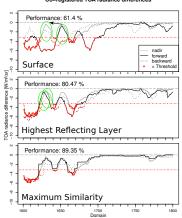
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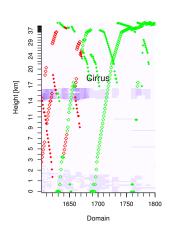
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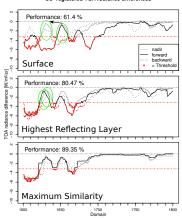
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### Alternative: Closure with SW and LW fluxes

▷ BBR flux retrieval algorithm is based on the multi-view capability of the BBR and the synergy between BBR and MSI

- ▷ BBR viewing design characterizes the radiance field of the observed target from 3 AT directions → improving observation of the surface-atmosphere anisotropy
- Non-linear combination of MSI radiances provides information on the scene anisotropy of the target
- ▶ The radiance-to-flux models convert the 3 BBR measurements. collocated at the HRL of the atmosphere-surface system, into flux estimates. Then the radiative fluxes are merged, thereby enabling comparison of measurement-derived fluxes against model-derived fluxes from 1D and 3D RT models.

# Methodology

- > SW ADMs for every BBR viewing angle are constructed using a feed-forward back-propagation artificial neural network (ANN) technique
- ▷ CERES radiance, solar geometry, MODIS radiances over clear/cloudy FOV area, cloud cover and surface ancillary parameters are inputs of the ANN training
- ▷ CERES SW anisotropic factors are used as outputs
- ▷ election of ANN input parameters depend on the scene class observed
- ▶ LW TOA Fluxes are obtained through theoretical polynomial second order regressions on the MSI 'split-window' channels BT differences
- $\triangleright$  Anisotropy models are classified in bins of 20  $Wm^{-2}sr^{-1}$
- A large RT-based geophysical database is used to train the data
- ▶ Anisotropic Factors are estimated from theoretical simulated thermal radiances and fluxes

### Overall Results

Within the 5000km-long frame, different co-registration methods led to following results:

Domains	Characteristics	P(SRF)	P(HRL)	P(MXS)
1400-1600	Cirrus and Cirrostratus Clouds	50.78%	68.38%	81.81%
1600-1800	Cirrus Clouds	61.4%	80.47%	89.35%
2800-3000	Deep Convective Clouds (horizontally heterogeneous)	49.62%	90.23%	92.04%
3000-3200	Deep Convective Clouds (horizontally homogeneous)	36.14%	82.10%	78.17%
3600-3800	Cirrus Clouds and cloud-free zones	47.49%	87.27%	89.32%
1052/5000	Only domains with Cumulus Clouds	84.37%	85.75%	85.27%
1933/5000	Only domains with Cirrus Clouds	71.94%	87.38%	91.98%
181/5000	Only domains with Deep Convective Clouds	75.52%	93.12%	89.98%
1286/5000	Only cloud-free domains	0.45%	0.45%	15.01%

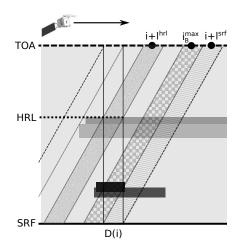
# How does Maximum Similarity Co-registration work?

#### In order to select an off-nadir radiance

- b take the nadir line-of-sight through reflecting layers of domain D
- □ and a subset of relevant off-nadir lines-of-sight (all intersecting with D)

$$ho \ s = \cos\Theta = \langle \frac{C_{\mathsf{nadir}}}{\|C_{\mathsf{nadir}}\|}, \frac{C_{\mathsf{oblique}}}{\|C_{\mathsf{oblique}}\|} \rangle$$

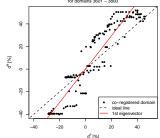
 pick the off-nadir radiance, belonging to the most similar off-nadir line-of-sight



# How to measure the goodness of co-registration?

- in EarthCARE, co-registration serves to identify inaccurate retrieval
- > for simplicity, we assume:
  - inaccurate retrieval of cloud parameters
  - reduces/enhances radiances by a fraction
  - equal relative difference between measured and simulated radiances in all 3 VZAs

#### Co-registered relative TOA radiance differences - MXS



- relative difference:  $d_i^{\nu} = \frac{I_{\nu}^{M}(i) I_{\nu}^{S}(i)}{I_{M}(i)}$
- $\triangleright$  which ideally lies on  $\vec{u}$  with  $n \in \mathbb{R}$ :  $\vec{u} = (1, 1, 1) \cdot n$
- ightharpoonup hence, X should scatter around  $\vec{u}$ :  $X = [m_1, \dots, m_{n_D}]$
- $\triangleright$  or  $\vec{w}_1$ , the first Eigenvector of X, lines up with  $\vec{u}$ :  $XX^TW = \lambda W = \lambda [\vec{w}_1, \vec{w}_2, \vec{w}_3]$
- ho with Eigenvalues  $\lambda$ :  $\lambda = [\lambda_1, \lambda_2, \lambda_3]$
- $\triangleright$  we measure the goodness of co-registration:  $P = \left(\frac{\vec{w}_1}{||\vec{w}_1||} \cdot \frac{\vec{u}}{||\vec{u}||}\right) \cdot \lambda_1 \cdot 100\%$

# Caveats of using 3D photon paths

### unrealistic 3D photon paths may happen because of:

- inaccurate retrieval
- inconsistent methodologies (3D scene constr., 3D MC RTM, . . . )

### potentially:

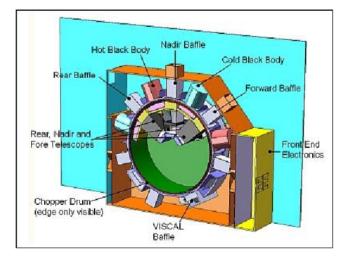
- ▶ we miss something, which is actually there

#### in case:

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- by the real structure is inaccurately retrieved
  - ▶ we identify it (by assigning just another errorous radiance) difference)
  - we fail identifying it (by selecting a low radiance difference)
- the real structure is fine
  - we falsely identify it
  - > we consider it fine

# BBR - details on set-up



### Overview of instruments

### atmospheric lidar - ATLID

- molecule/cloud/aerosol separation
- $\triangleright$  every 100m with diameter of 5/12m

### cloud profiling radar - CPR

- □ dopplerized 94 GHz
- ▷ liquid/ice clouds, light rain





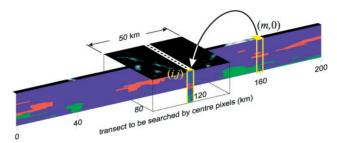
### multispectral imager - MSI

- ▶ 4 solar channels, 3 thermal channels

#### broadband radiometer - BBR

- □ 3 spatialdirection alongtrack 55°backward, nadir, 55°forward
- $\triangleright 1km \times 1km$  footprint in nadir
- $\triangleright$  for comparability/noise reduction transformed into  $10km \times 10km$

## Scene construction algorithm



#### Data

- ▷ 2D cross section (RXS)
  - vertical and horizontal information
  - clouds (liquid/ice), aerosols, gases
- ▷ 2D image of MSI (along and across track)

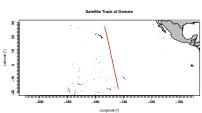
#### Algorithm

- combine RXS details and MSI info
- donate RXS properties to off-track pixels
- picking the most similar spectral footprint
- in certain region around recipient pixel
- → obtain detailed information in 3D

### **CCCM** Data

- CFRFS-CALIPSO-CloudSat-MODIS (CCCM) consists of:
  - CloudSat's Cloud-Profiling Radar
  - CALIPSO's lidar

  - and CERES



- ▷ CERES provides only radiances close to nadir , and lacks BBR's 2 off-nadir views
  - ▶ therefore, we generate both BBR measurement and 3D Monte Carlo RTS outputs
- □ using a 5000km long section, measured on 5th July 2006 over equatorial Pacific

# For devouring...



[Barker al., 2003]

Monte Carlo Simulation of Solar Reflectances for Cloudy Atmospheres Journal of the Atmospheric Sciences, 60(16):1881-1894, 2003.



[Barker al., 2011]

A 3D cloud-construction algorithm for the EarthCARE satellite mission. Journal of the Royal Meterological Society, 2011.



FLURB - FLUx Retrievals from FarthCARE BBR Observations

FU Berlin, Environment Canada, RMI of Belgium, Atmospheric and Climate Applications Inc., 2006.



[EarthCARE Mission Advisory Group, 2006] EarthCARE Mission Requirements Document, ESA and JAXA, 2006.

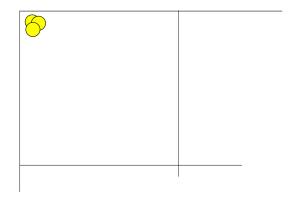


FarthCARE mission instruments Fact sheet

European Space Agency, 2011.

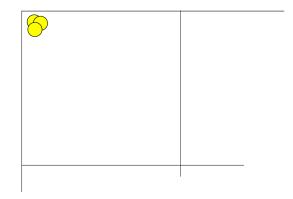
- > 3D radiative transfer
- distribute photons over whole domain
- > follow each bunch of photons
- > at each event:

  - ▷ calculate rad.



- > 3D radiative transfer
- distribute photons over whole domain
- > follow each bunch of photons
- > at each event:

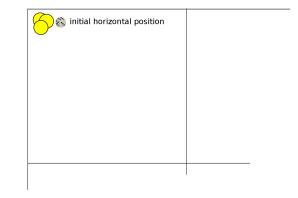
  - ▷ calculate rad.



- > 3D radiative transfer
- distribute photons over whole domain
- of photons
- > at each event:

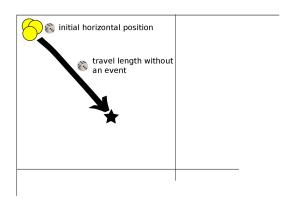
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▷ calculate rad.

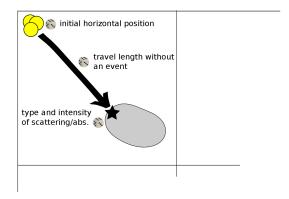


- > 3D radiative transfer
- distribute photons over whole domain
- > follow each bunch of photons
- > at each event:

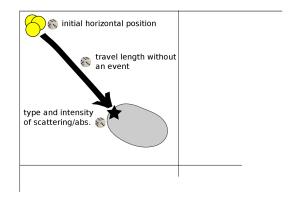
  - ▷ calculate rad.



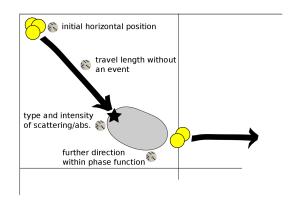
- > 3D radiative transfer
- over whole domain
- > follow each bunch of photons
- > at each event:
  - □ use phase
  - ▷ calculate rad.



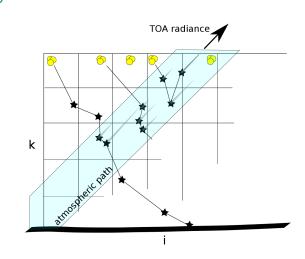
- > 3D radiative transfer
- over whole domain
- > follow each bunch of photons
- > at each event:
  - use phase function
  - calculate rad. contribution to BBR observations



- > 3D radiative transfer
- distribute photons over whole domain
- > follow each bunch of photons
- > at each event:
  - use phase function
  - calculate rad. contribution to BBR observations



- - the sum over all radiative contributions
- and full atmospheric paths for each viewing direction
  - a vector of radiative contributions for each vertical level



- - the sum over all radiative contributions
- and full atmospheric paths for each viewing direction
  - a vector of radiative contributions for each vertical level

